

# Soil Moisture Active Passive Mission SMAP

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## Improving Brightness Temperature Measurements Near Costal Areas

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Association



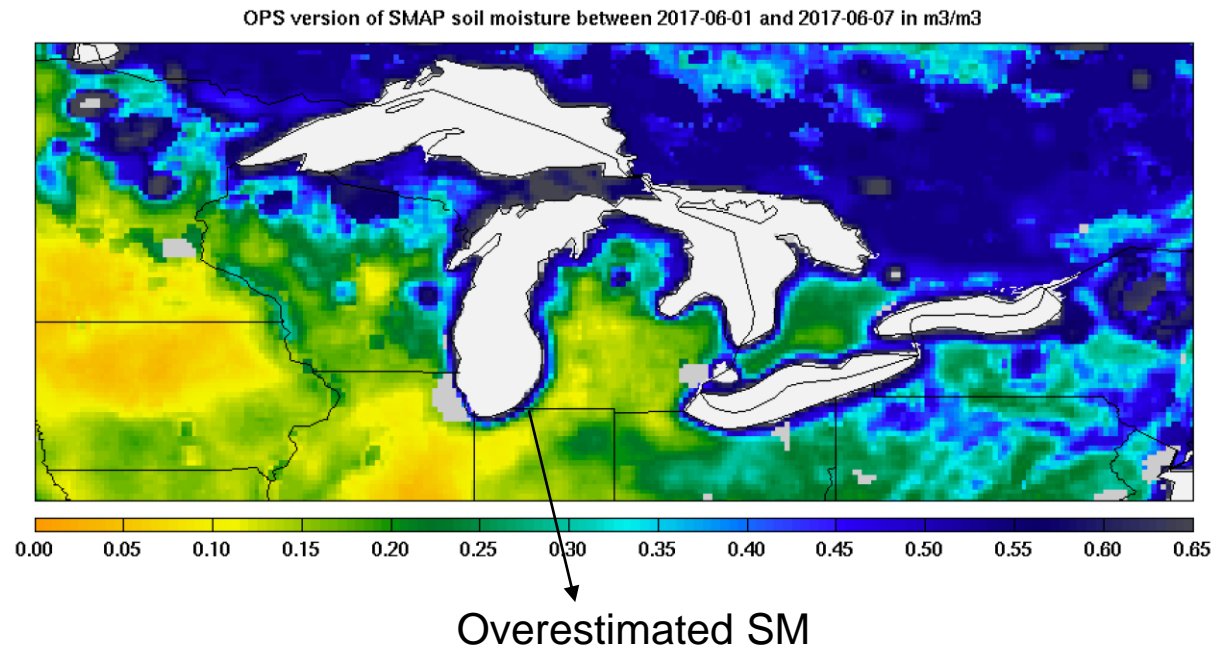
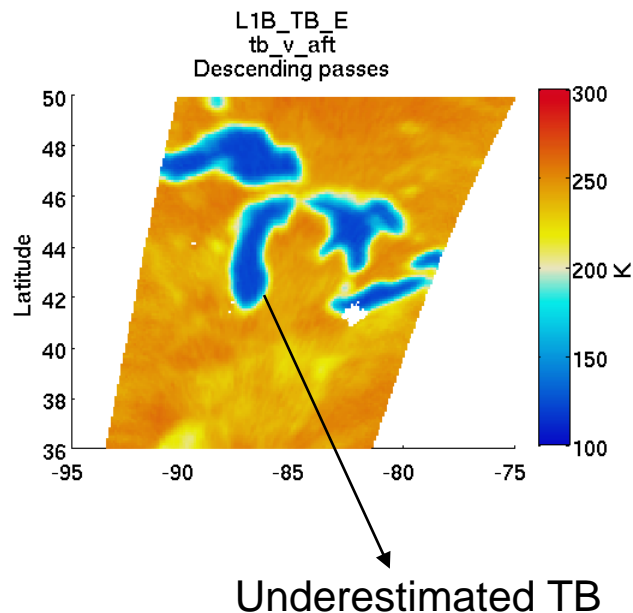
# Outline

- Motivation
  - Overview of the applied theory for L1B\_TB product and L1B\_TB\_E
  - Simulated data and sensitivity analysis
  - Simulated examples and results
  - Application to real data and results
-



# Water contamination correction

- SMAP radiometer footprints over land can cover water from open water bodies or near coastlines
- Emissions by water integrated with emission by land, leads to underestimation of land TB
- Underestimated land TB leads to wet bias in soil moisture retrieval



# Water contamination correction implementation



The total measured temperature can be separated into two contributions:

$$TB_p = (1 - f) * TB_p^{land} + f * TB_p^{water} \quad (p = v \text{ or } h)$$

– If footprint is on land we apply the formula:

$$TB_p^{land} = \frac{TB_p - f * \overline{TB}_p^{water}}{1 - f}$$

- $\overline{TB}_p^{water}$  is an estimated  $TB$  at boresight computed from ocean SMAP observations free of contamination.

where  $f$  is the water fraction.  $f=1$  in pure water and  $f=0$  for pure land.

$$f = \int G \cdot M d\Omega = \int_{\theta=[0,\pi], \psi=[0,2\pi]} G(\theta, \psi) M(\theta, \psi) \sin \theta \, d\theta d\psi \cong \int_{\theta=[0,10*\pi/180], \psi=[0,2\pi]} G(\theta, \psi) M \sin \theta \, d\theta d\psi$$

- $M$  is the land mask defined over 1Km EASE2 grid.



# L1B\_TB\_E implementation

- If grid point is on land we apply the formula:

$$TB_p^{land} = \frac{TB_p - f * \overline{TB}_p^{water}}{1 - f}$$

- If grid point is on water we apply the formula:

$$TB_p^{water} = \frac{TB_p - (1 - f) * \overline{TB}_p^{land}}{f}$$

where  $f$  is the water fraction.  $f=1$  in pure water and  $f=0$  for pure land.

$$f = \sum_{i=1}^6 a_i f_i \quad \text{where } a_i \text{ are the Backus Gilbert coefficients.}$$





# Study based on simulations



- We first perform a simulation study to help us make decisions on how to apply the algorithm to real data.
  - How well does our algorithm perform over simulated data?
  - How to best estimate brightness temperature over water or ocean - computed from ancillary data or SMAP observations?
  - How big should the averaging area be?
  - What is the sensitivity of our algorithm to levels of water contamination in the applied estimated brightness temperature?
-



# Simulation



$$TB = \int G \cdot tb d\Omega = \int_{\theta=[0,\pi], \psi=[0,2\pi]} G(\theta, \psi) tb(\theta, \psi) \sin \theta \, d\theta d\psi$$
$$\cong \int_{\theta=[0, 10 \cdot \pi / 180], \psi=[0, 2\pi]} G(\theta, \psi) tb(\theta, \psi) \sin \theta \, d\theta d\psi$$

- Dielectric constant ( $\epsilon$ ) over ocean is generated by using Klein and Swift model.
- Dielectric constant ( $\epsilon$ ) over land is generated by using Mironov model.

$$\bullet \quad R_{vv} = \frac{\epsilon \cos \theta - \sqrt{\epsilon - \sin^2 \theta}}{\epsilon \cos \theta + \sqrt{\epsilon - \sin^2 \theta}} \quad R_{hh} = \frac{\cos \theta - \sqrt{\epsilon - \sin^2 \theta}}{\cos \theta + \sqrt{\epsilon - \sin^2 \theta}}$$

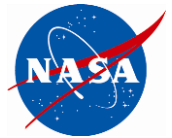
$$tb = (1 - |R|^2) T_s$$

- TB over land is computed using plane surface model.
- TB over ocean is computed using model that takes into account wind.
- For comparison we also compute the TB\_3dB integrating the  $tb$  within the 3dB beam and only over land ( $M$  land mask)

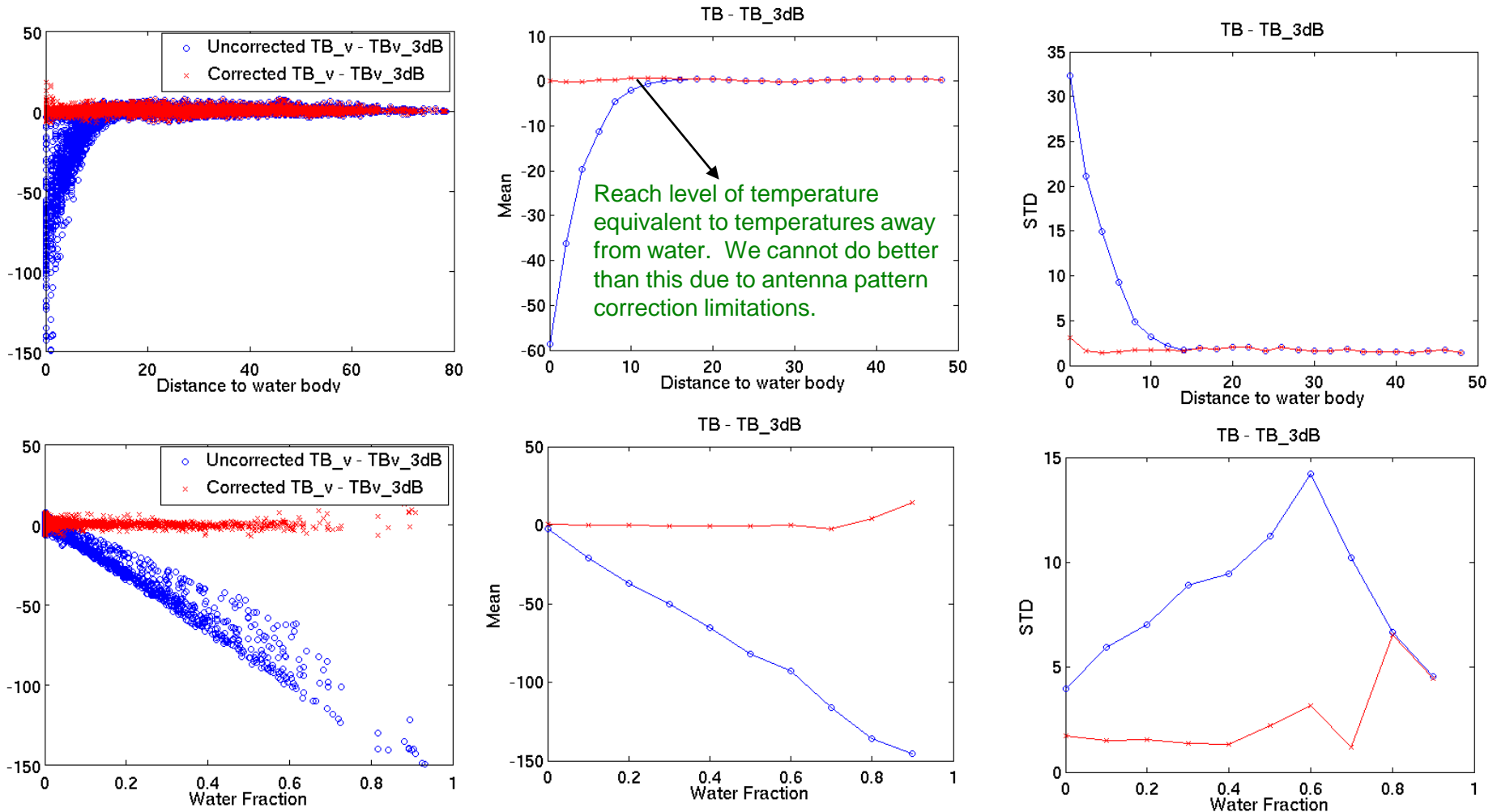
$$TB_{3dB} = \int_{3dB} G M tb d\Omega$$



# Statistics based on simulation

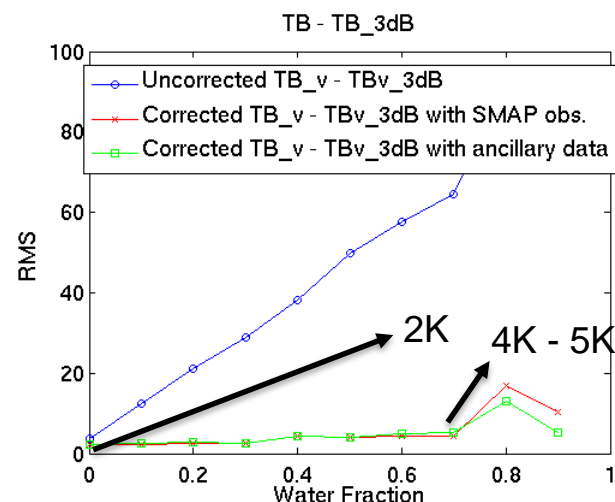
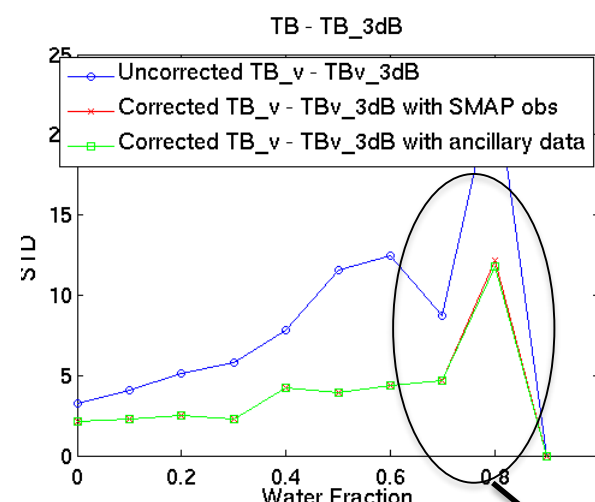
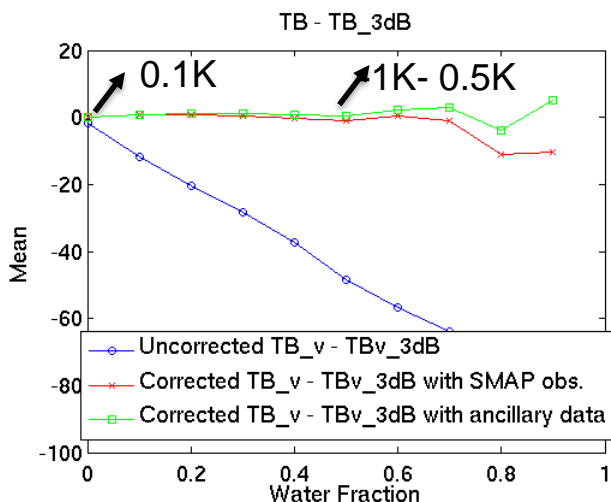
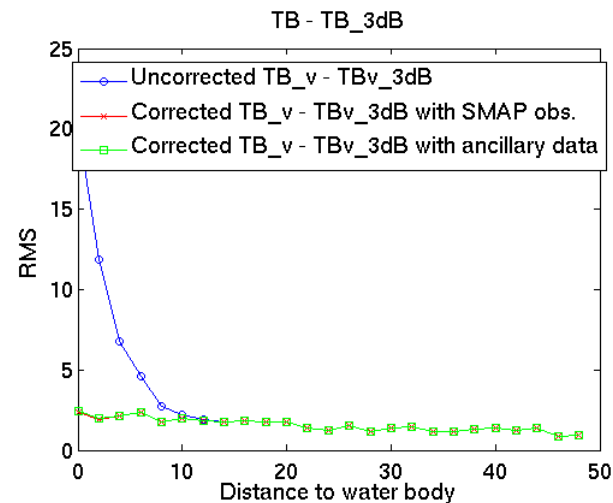
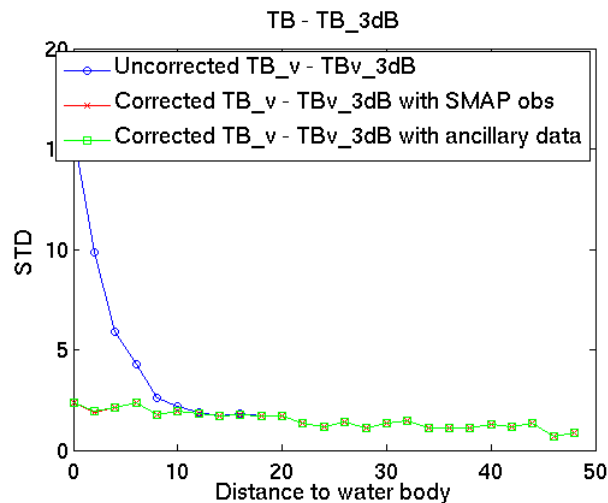
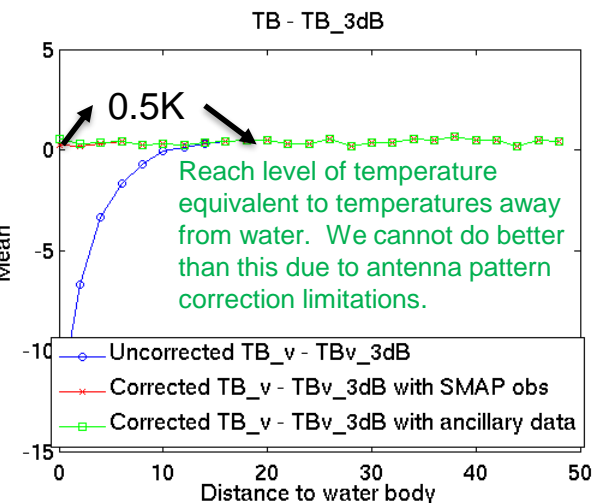
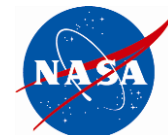


- We compare the brightness temperature against the TB<sub>3dB</sub>
- Differences are reduced after corrections.
- Mean values close to water reach same levels as differences away from water





# Statistics based on simulations – Great Lakes SMAP observation vs ancillary data

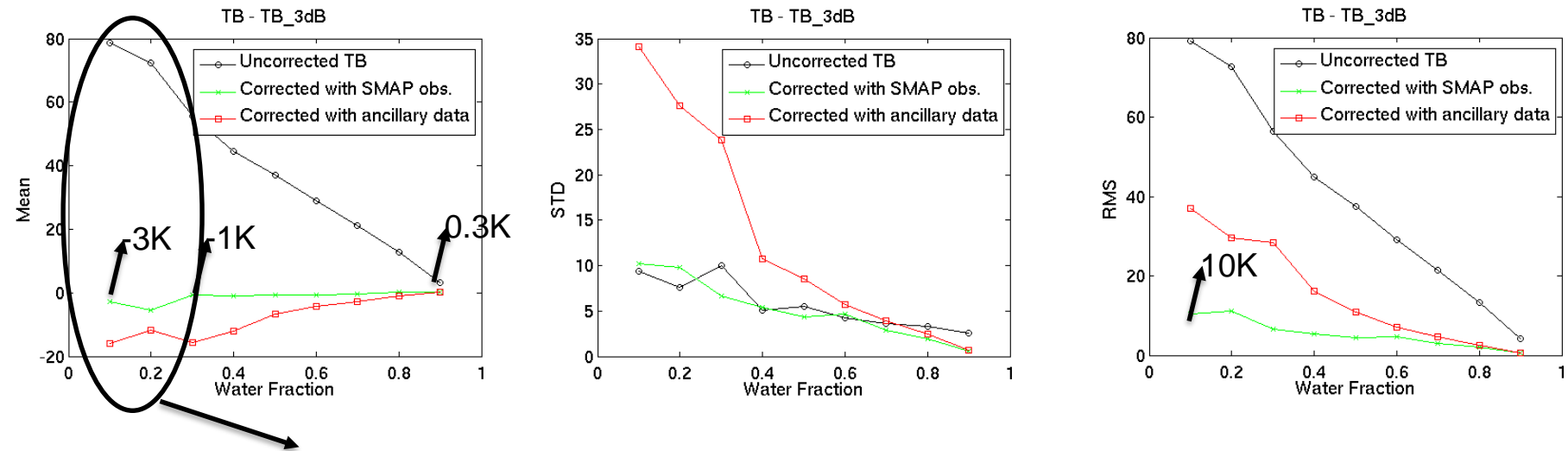


This area corresponds to small islands. No enough data for stats

# Statistics based on simulations – Great Lakes SMAP observation vs ancillary data



The use of SMAP observations shows much better performance over water

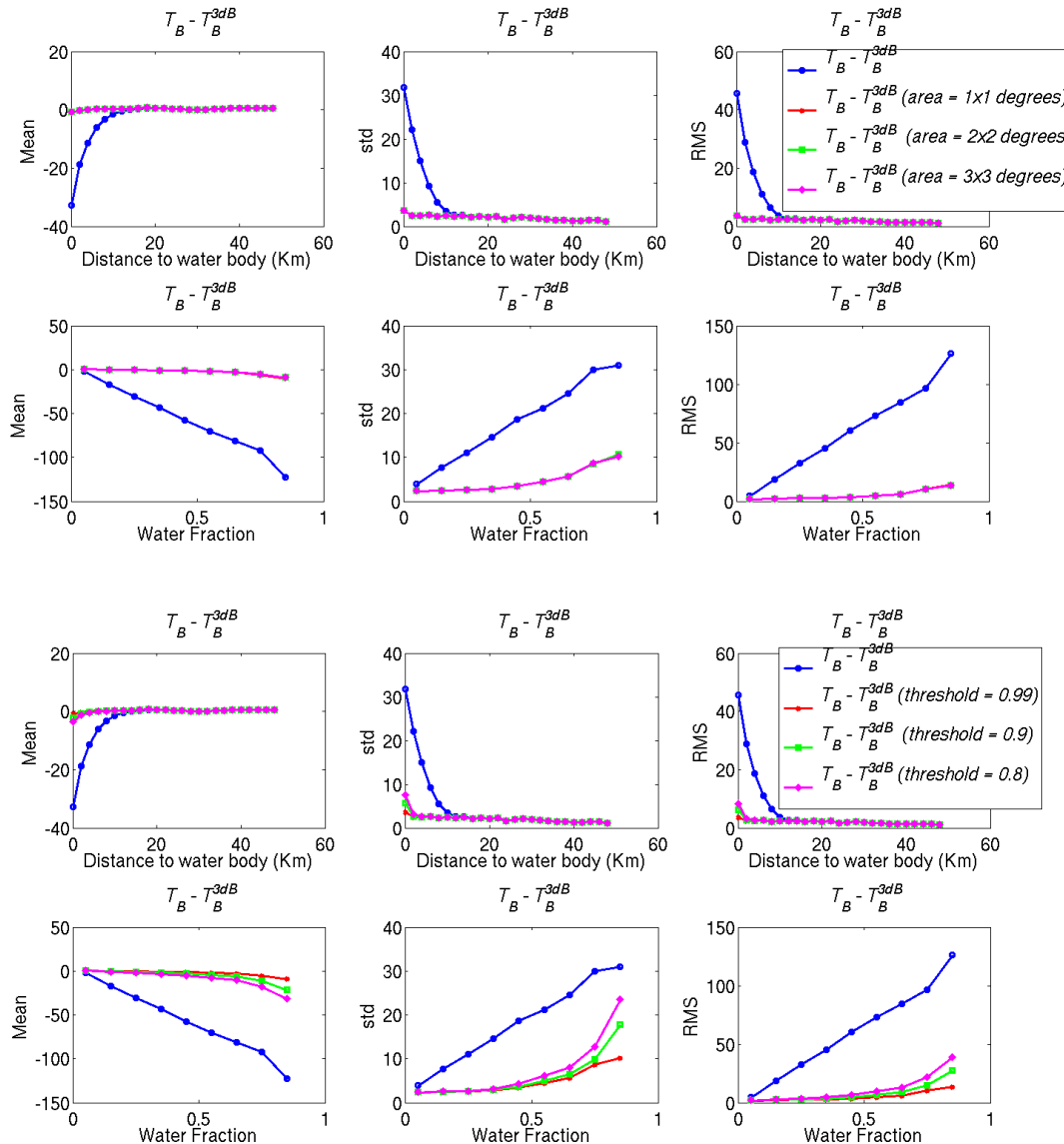


This area corresponds to small lakes. No enough data for stats

0=Land 1=Water



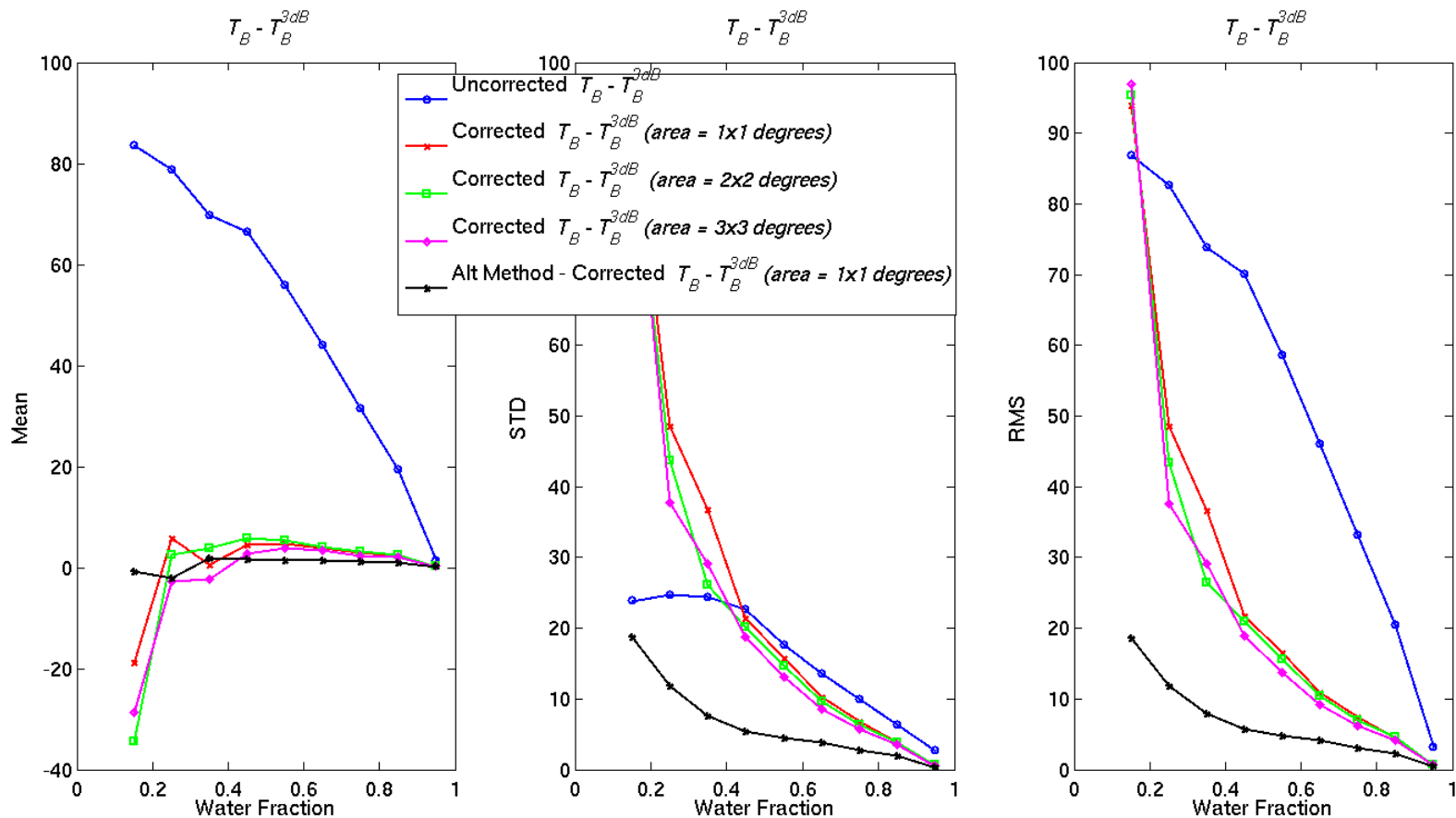
# Sensitivity analysis



Mean, std, and RMSE resulting from the water contamination correction. We display the difference of uncorrected  $T_B - T_{B_{land}}^{3dB}$  (blue line) and corrected  $T_B - T_{B_{land}}^{3dB}$  for several searching areas (1x1 degrees, 2x2 degrees and 3x3 degrees ). Top row displays statistics as a function of distance to water bodies. Bottom row displays statistics as a function of water fraction.

Mean, std, and RMSE resulting from the water contamination correction. We display the difference of uncorrected  $T_B - T_{B_{land}}^{3dB}$  (blue line) and corrected  $T_B - T_{B_{land}}^{3dB}$  for several thresholds (0.99, 0.9, 0.8). Top row displays statistics as a function of distance to water bodies. Bottom row displays statistics as a function of water fraction.

# Estimated land brightness temperature to retrieve water TB

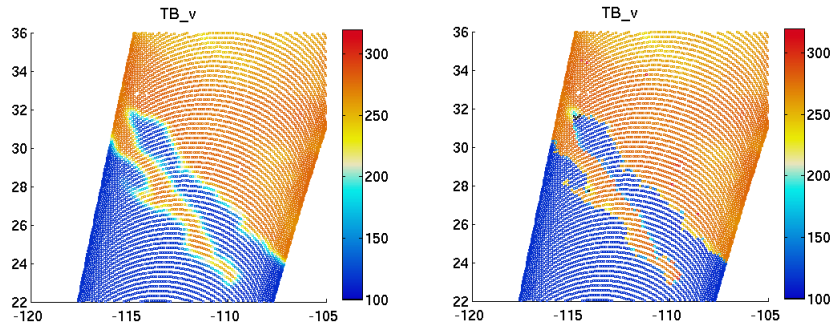


- Figure shows better performance when we use what we call alternative approach.
- Alternative approach uses already corrected land brightness temperature to estimate land temperature used to retrieve water TB.s

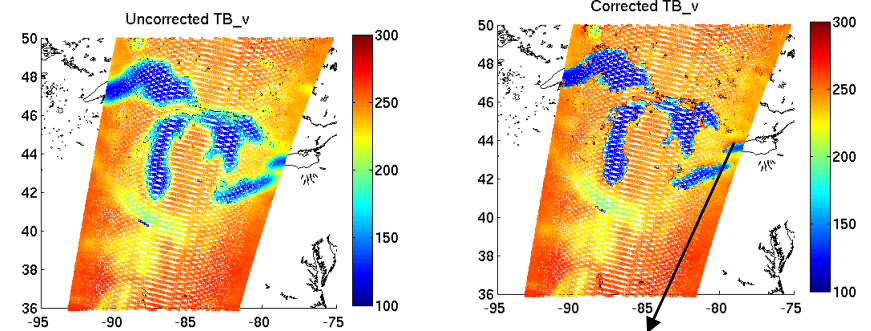


# Results from Product

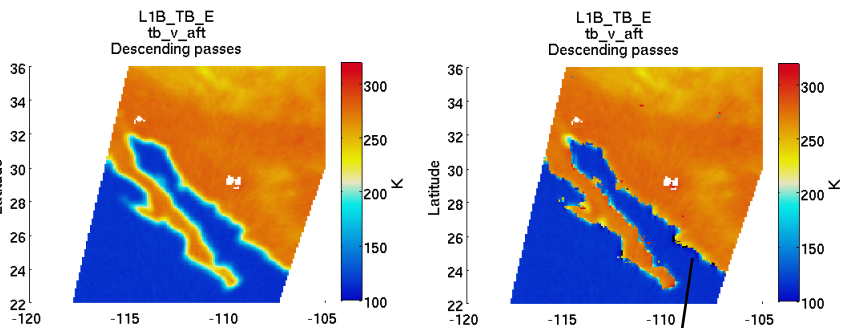
## Baja California



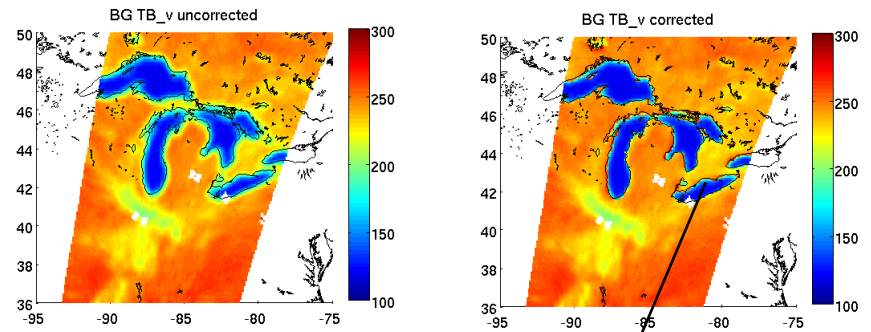
## Great Lakes



Over estimating land temperature.



Underestimating ocean TB.



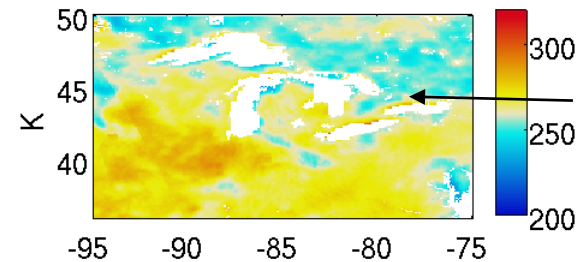
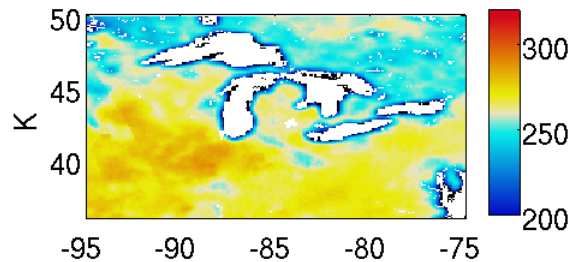
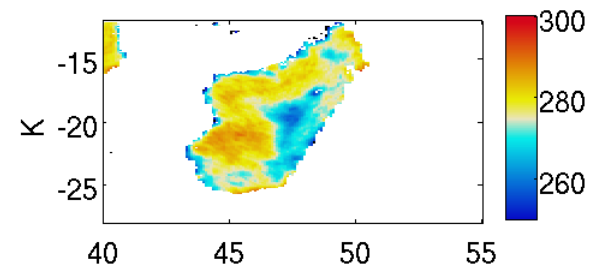
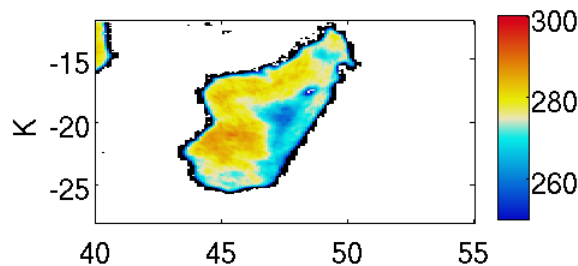
Over estimating water temperature.

- Sharper coastlines
- Detection of small islands
- Some anomalies: under or over estimation of brightness temperatures

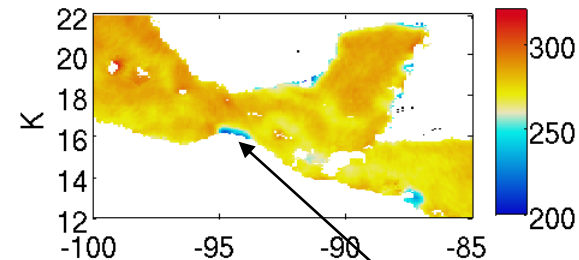
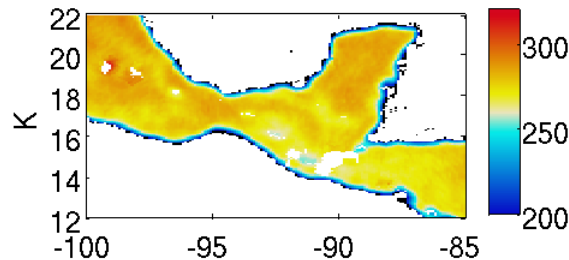


# Results over land from real data

06/[04-06]/2018



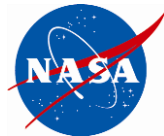
Over estimating  
land temperature.



Underestimating land TB.

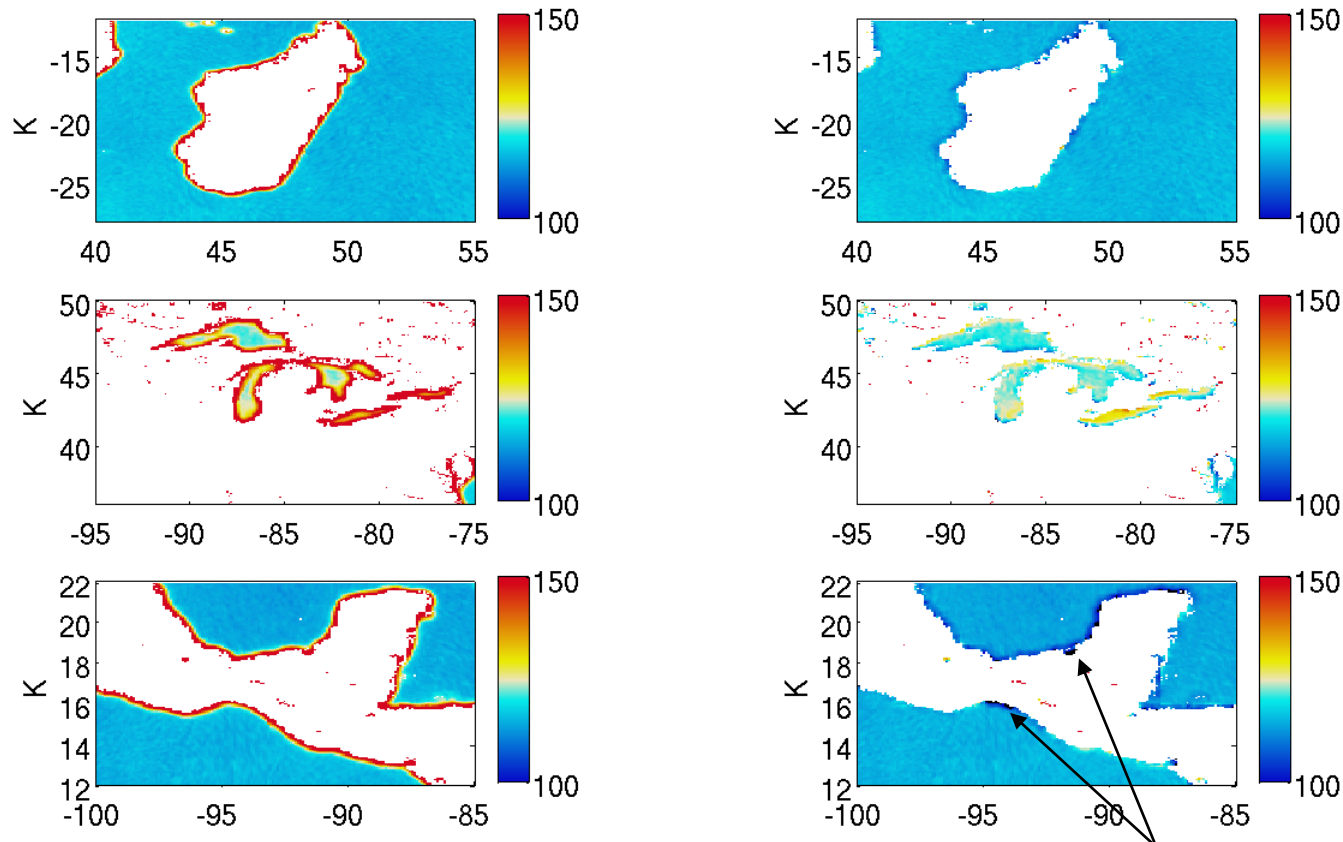
- Sharper coastlines
- Detection of small islands
- Some anomalies: under or over estimation of brightness temperatures





# Results over water from real data

06/[04-06]/2018



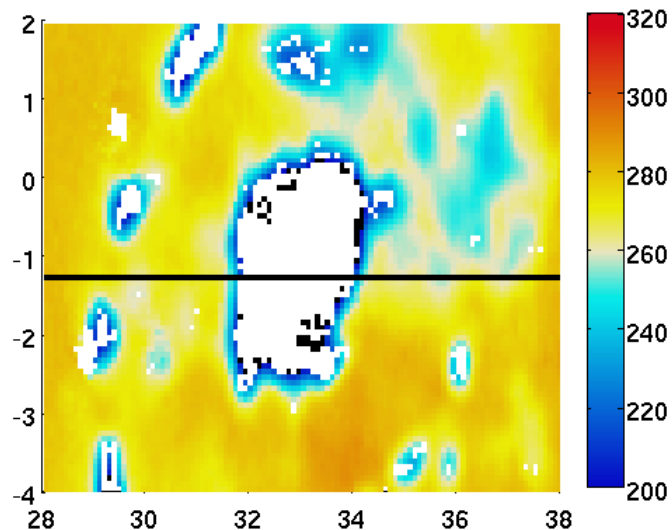
Underestimating ocean TB.

- Sharper coastlines
- Detection of small islands
- Some anomalies: over estimation of brightness temperatures

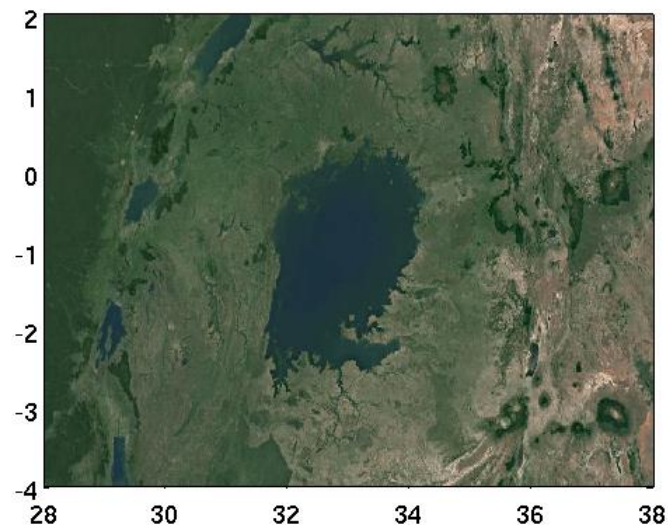


# Lake Victoria

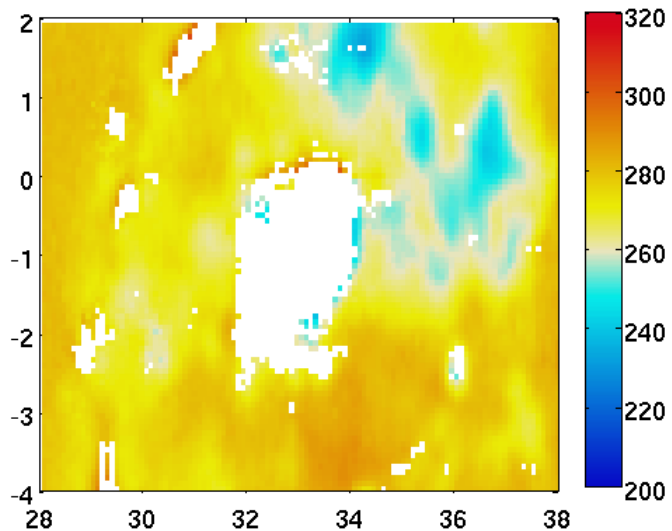
Lake Victoria



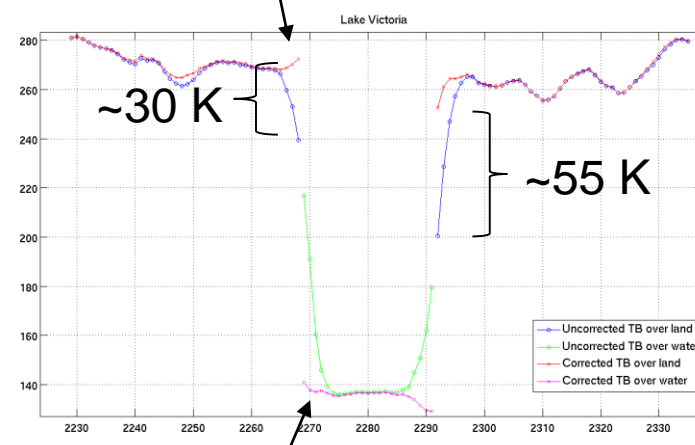
Lake Victoria



Lake Victoria



Over estimating land temperature.



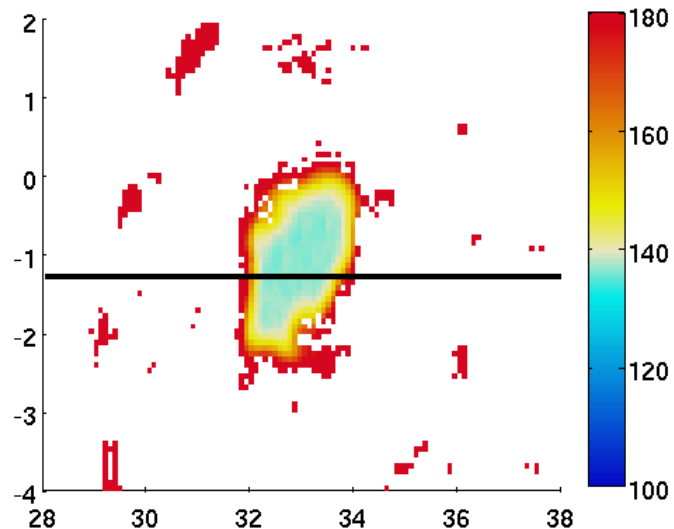
Over estimating water temperature.

Caused by  
Geolocation  
Errors?

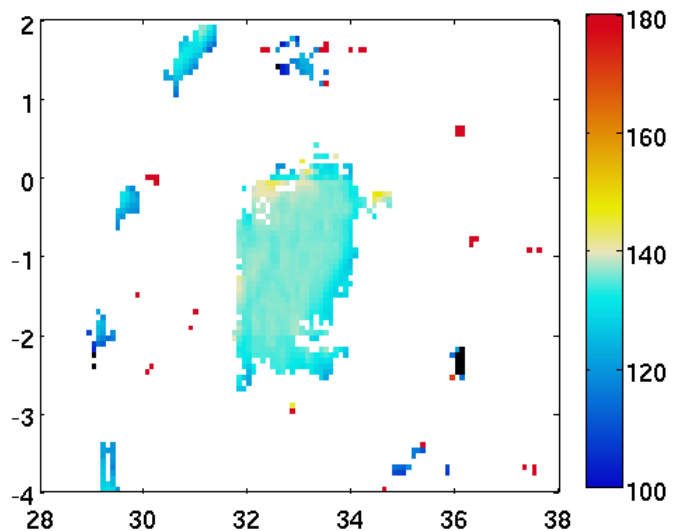
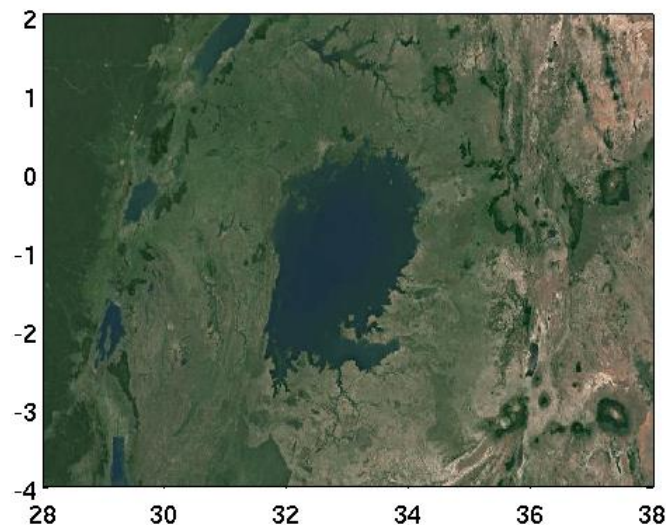


# Lake Victoria

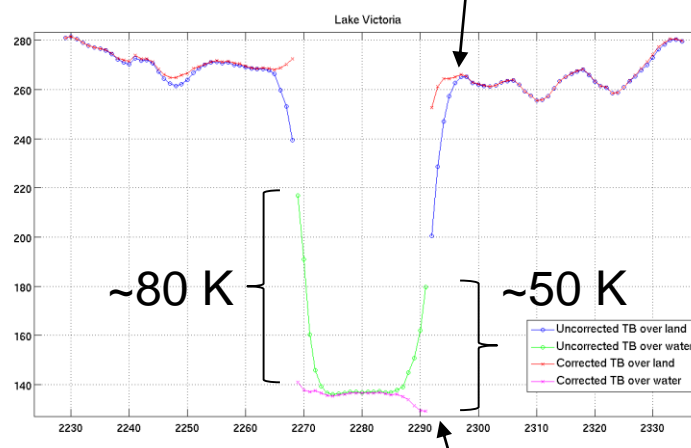
Lake Victoria



Lake Victoria



Underestimating land TB.



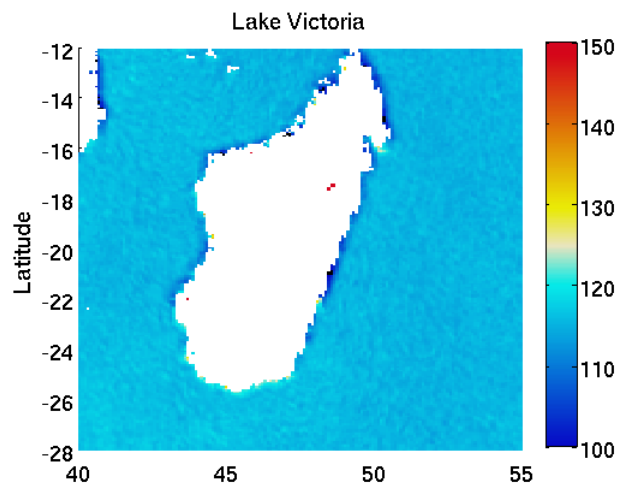
Caused by  
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Underestimating water TB.

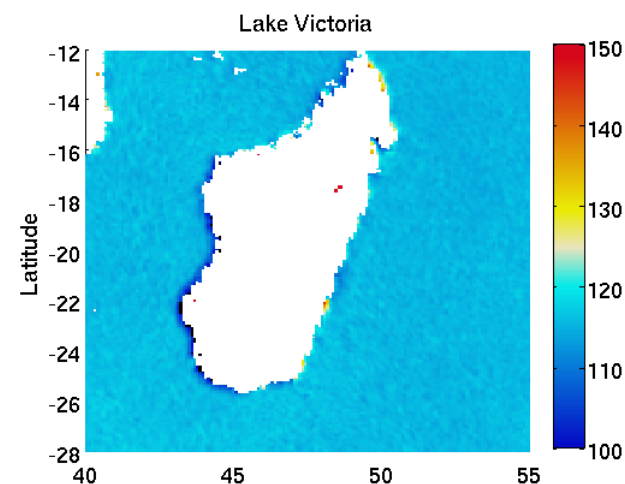


# Possible geolocation errors

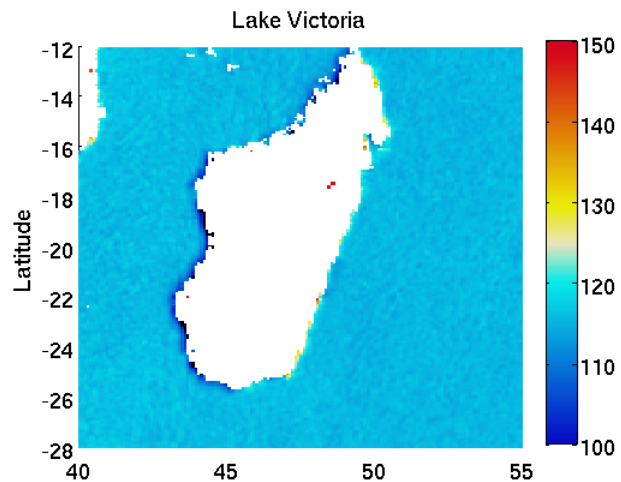
## Ascending aft pass



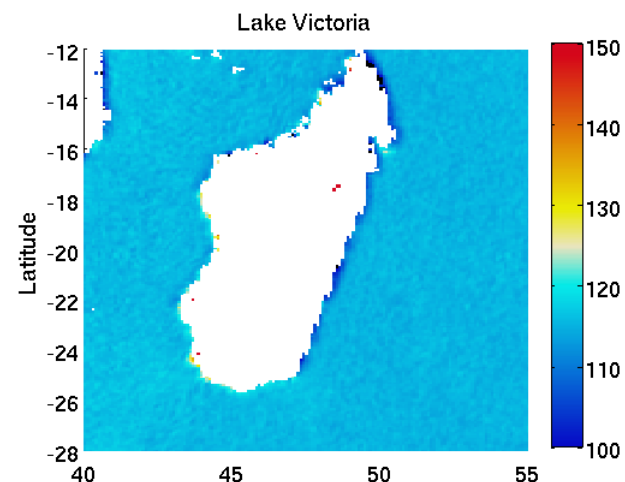
## Ascending fore pass



## Descending aft pass

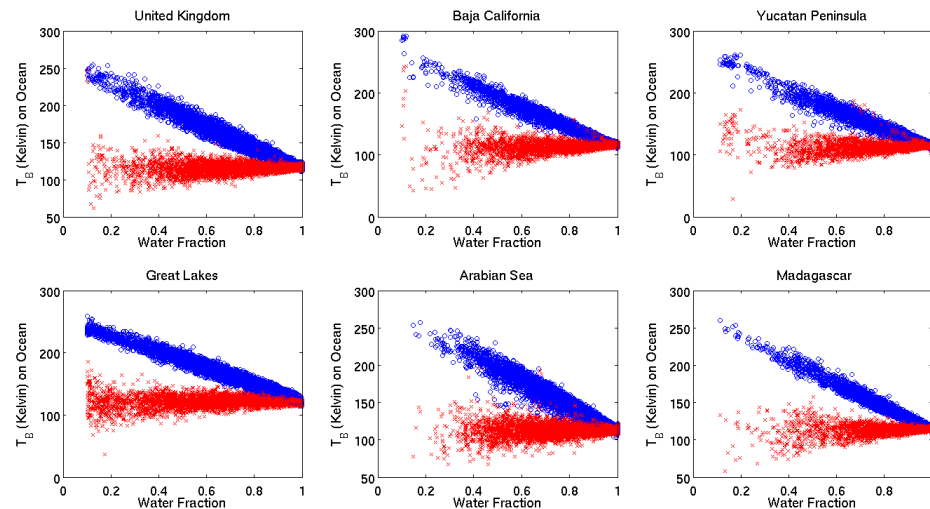


## Descending fore pass

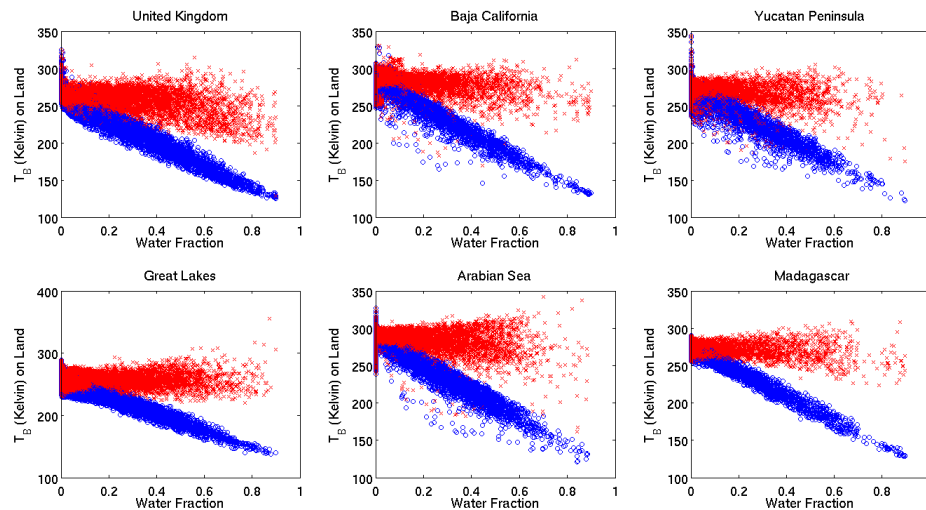




# Bias removal – Results based on real data



Scattering plot of uncorrected  $T_B$  (blue circles) and corrected land  $T_B$  (red times) as a function of Water fraction. From left to right; Top: United Kingdom, Baja California and Yucatan Peninsula; Right: Great Lakes, Arabian Sea and Madagascar. Before correction the  $T_B$  decrease with land fraction and after correction, we remove that dependence.

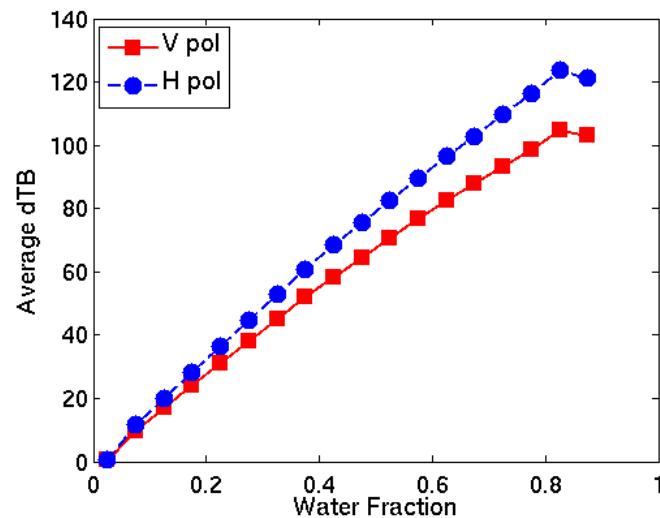


Scattering plot of uncorrected  $T_B$  (blue circles) and corrected water  $T_B$  (red times) as a function of Water fraction. From left to right; Top: United Kingdom, Baja California and Yucatan Peninsula; Right: Great Lakes, Arabian Sea and Madagascar. Before correction the  $T_B$  decrease with land fraction and after correction, we remove that dependence.

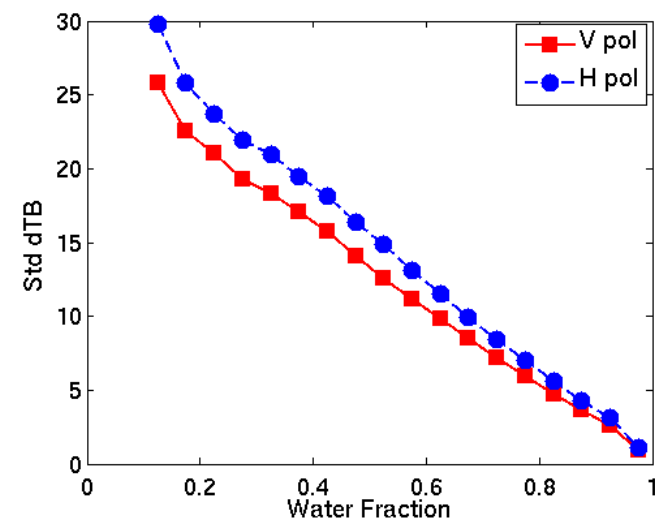
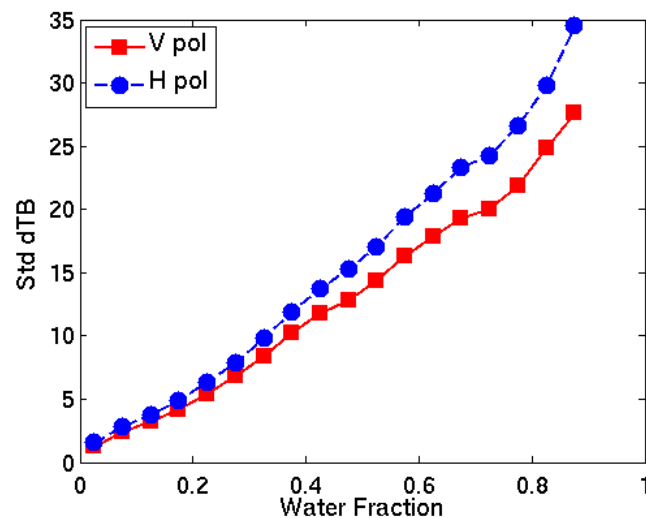
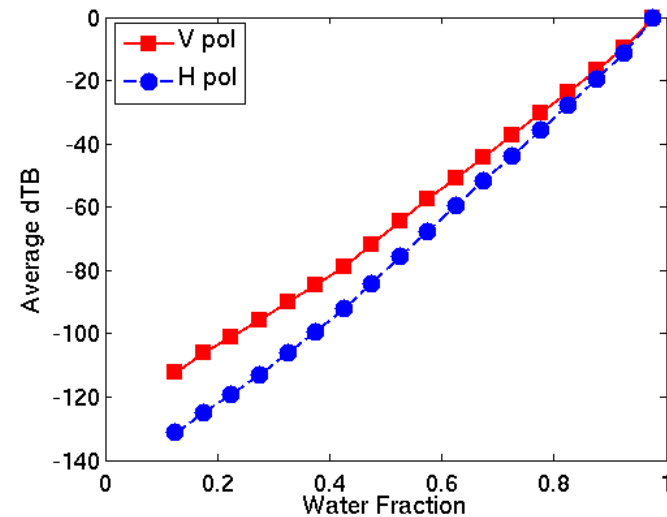
# Expected correction values as a function of water fraction and the expected uncertainty



## Land TB correction uncertainty



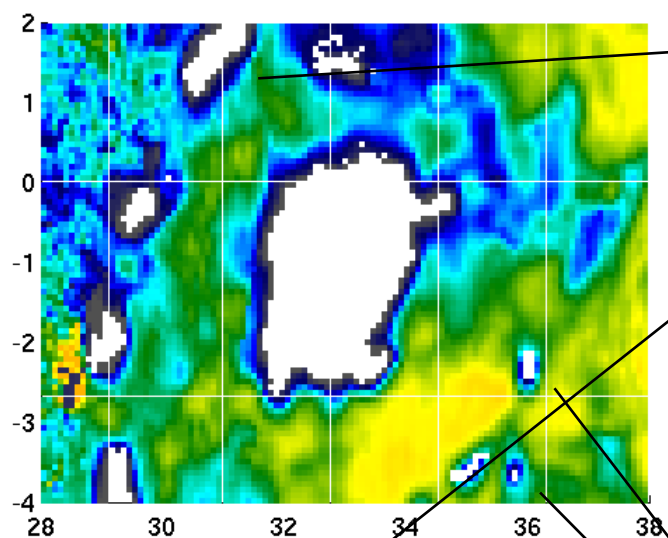
## Water TB correction uncertainty





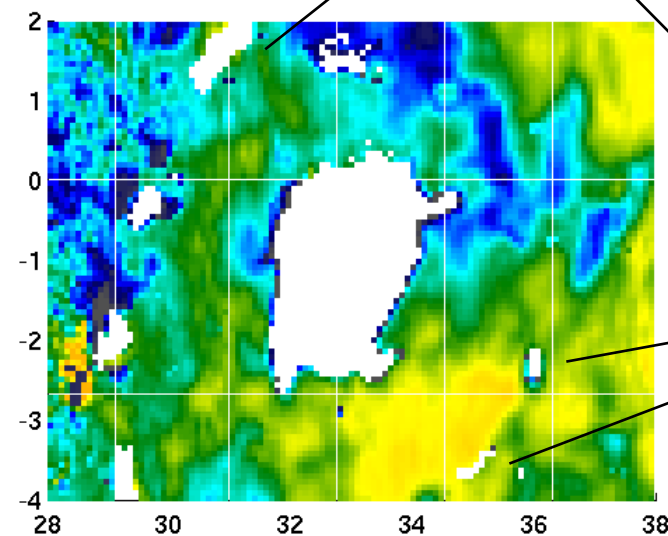
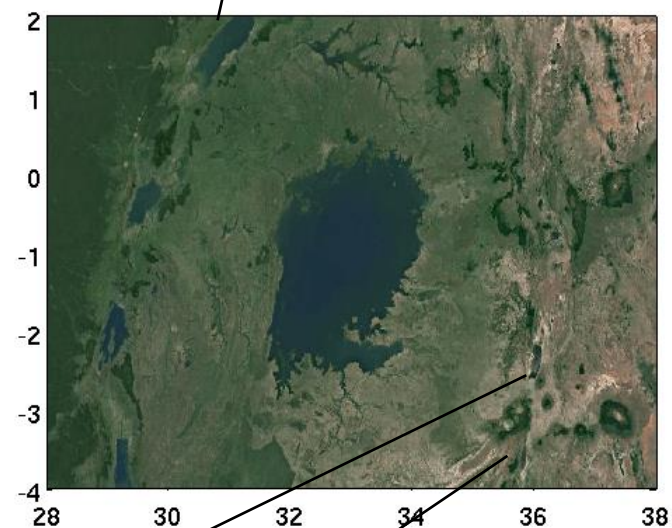


# Lake Victoria



Blue rings around lakes eliminated or reduced

Lake Victoria



Blue rings around lakes eliminated



# Future Work

- Perform correction on icy areas. The current implementation does not perform correction in areas with an ice fraction other than zero
- Incorporate dynamic land mask and ice mask
- Improve correction considering water bodies seasonal changes.